

Replication Codes and Data

The Value of Private Schools: Evidence from Pakistan

Review of Economics and Statistics

Pedro Carneiro

University College London, Institute for Fiscal Studies and
Centre for Microdata Methods and Practice

Jishnu Das

Georgetown University

Hugo Reis

Banco de Portugal and Católica Lisbon School of Business & Economics

August 15, 2022

Overview

There are two main sets of analysis, which are discussed in turn below. The structural analysis is done in Matlab (first step estimation and policy experiments), while the OLS/IV type of analysis, namely the main tables and figures are performed in STATA. Both parts are necessary to fully replicate the paper's analysis. If you require additional information, please contact at hfreis@bportugal.pt.

1 OLS/IV analysis

Final paper analysis run in STATA/MP 16.1 for Windows (64-bit x86-64).

1.1 Stata do files

- (a) Main_Tables_Figures.do - performs the analysis to obtain all tables and figures in the manuscript.
- (b) Online_App_A_and_C.do - performs all tables in the online appendix A and C.
- (c) Online_App_D.do - master do-file to perform all tables in the online appendix D.
- (d) Data_girls_reg.do and Data_boys_reg.do - file to merge the different datasets for estimation purposes.
- (e) Data_delta_aux_g.do and Data_delta_aux_b.do - file to import/copy school fixed effects variable from Matlab to obtain the dataset to run the OLS/IV estimation in STATA.
- (f) Data_elast_aux_g.do and Data_elast_aux_b.do - file to import/copy elasticity variable from Matlab to obtain the dataset in STATA to calculate the elasticities.
- (g) Data_cv_enr_aux_g.do and Data_cv_enr_aux_b.do - file to import/copy policy experiment variables (compensating variation and probability of enrollment in each option from the choice set) from Matlab to get the dataset in STATA to calculate policy experiment results.
- (h) boot_girls.do and boot_boys.do - file to calculate bootstrapped standard errors.

1.2 Stata datasets

- (a) data_sumstat_girls_pr.dta and data_sumstat_boys_pr.dta - files to run the summary statistics at individual and household level.
- (b) data_sch_reg_girls.dta and data_sch_reg_boys.dta - files to run the summary statistics and OLS/IV analysis at school level.
- (c) mauza_tehsil_id.dta - village and sub-districts id.

- (d) `school_costs.dta` - school level dataset with the costs for each school.
- (e) `sch_dist_inst_girls.dta` and `sch_dist_inst_boys.dta` - school distance instruments.
- (f) `ST_data_elast_girls` and `ST_data_elast_boys` - auxiliary files to obtain elasticities.
- (g) `Elast_fig_aux_g` and `Elast_fig_aux_b` - files to calculate elasticities.
- (h) `ST_data_cv_enr_noprivate_girls` and `ST_data_cv_enr_noprivate_boys` - files to calculate the results of the No private school policy experiment.
- (i) `ST_data_cv_enr_voucher_girls` and `ST_data_cv_enr_voucher_boys` - files to calculate the results of the Voucher policy experiment.
- (j) `boot_res_g.dta` and `boot_res_b.dta` - auxiliary file to calculate bootstrapped standard errors.

Note: For the on-line appendix all datasets are listed in the beginning of the do-files.

2 Structural analysis

Final paper analysis run in MATLAB R2018a.

2.1 Matlab m-files

- (a) `mle_unobs_girls_mean.m` and `mle_unobs_boys_mean.m` - runs the entire analysis to obtain the first step estimates in equation (5) by Maximum likelihood for girls and boys at the mean.
- (b) `objfun_unobs.m` - Optimization routine with the objective function running inside the main m-file for both girls and boys.
- (c) `mktsh_test_sim_mktid.m` - function to obtain market shares (inside `objfun_unobs_main.m`).

- (d) `mle_unobs_girls_p25(75).m` and `mle_unobs_boys_p25(75).m` - runs the entire analysis to obtain the first step estimates in equation (5) by Maximum likelihood for girls at the percentile 25 and 75.
- (e) `Elasticities_Simulation_girls.m` and `Elasticities_Simulation_boys.m` - run the simulations to obtain the inputs to calculate the elasticities and policy counterfactual results.
- (f) `mle_unobs_girls_grades.m` and `mle_unobs_boys_grades.m` - runs the entire analysis to obtain the first step estimates for different grades.
- (g) `Individual_Preferences_girls.m` and `Individual_Preferences_boys.m` - file to obtain the inputs to calculate the correlations regarding individual preferences.
- (h) `mle_unobs_girls_full.m` and `mle_unobs_boys_full.m` - runs the entire analysis to obtain the first step estimates for the robustness analysis using the full specification.
- (i) `objfun_unobs_full.m` - Optimization routine with the objective function running inside the main m-file for the full specification.
- (j) `elast_fee_dist_full_girls.m` and `elast_fee_dist_full_boys.m` - routine to obtain the inputs to calculate the elasticities using the full specification.
- (k) `mle_unobs_girls_nchild.m` and `mle_unobs_boys_nchild.m` - runs the entire analysis to obtain the first step estimates for the robustness analysis using the specification with number of children in the household.
- (l) `objfun_unobs_nchild.m` - Optimization routine with the objective function running inside the main m-file for the specification with number of children in the household.
- (m) `elast_fee_dist_nchild_girls.m` and `elast_fee_dist_nchild_boys.m` - routine to obtain the inputs to calculate the elasticities using the specification with number of children in the household.

- (n) `mle_unobs_girls_distsq.m` and `mle_unobs_boys_distsq.m` - runs the entire analysis to obtain the first step estimates for the robustness analysis using the specification with quadratic distance term.
- (o) `objfun_unobs_distsq.m` - Optimization routine with the objective function running inside the main m-file for the specification with quadratic distance term.
- (p) `elast_fee_dist_distsq_girls.m` and `elast_fee_dist_distsq_boys.m` - routine to obtain the inputs to calculate the elasticities using the specification with quadratic distance term.
- (q) `Simulation_one_private_girls.m` and `Simulation_one_private_boys.m` - run the simulation to obtain the inputs to calculate the counterfactual results for the one private school policy experiment.

2.2 Matlab datasets

- (a) `data_girls` and `data_boys` - individual attributes and school level covariates with the choice set of schools for each individual.
- (b) `data_girls_gr34` and `data_boys_gr34` - individual attributes and school level covariates with the choice set of schools for each individual eligible to be enrolled in grades 3 and 4.
- (c) `data_girls_gr5` and `data_boys_gr5` - individual attributes and school level covariates with the choice set of schools for each individual eligible to be enrolled in grade 5.
- (d) `one_priv_g` and `one_priv_b` - auxiliary data to use on the one private school policy experiment.

Note: The description of the variables is available in the beginning of each m-file.

Instructions

The estimation procedure is iterative as explained in the article in detailed.

The main guidelines are the following:

A - Estimation results:

(i) Run `mle_unobs_girls_mean.m` and `mle_unobs_boys_mean.m` to obtain the school fixed effects estimates (`delta_girls_mean` and `delta_boys_mean`)

(ii) Import/copy `delta_girls_mean` and `delta_boys_mean` fom Matlab to Stata using `Data_delta_aux_g.do` and `Data_delta_aux_b.do`

(iii) Run `Main_Table_Figure.do` (or `Online-App_A_and_C.do`) to obtain OLS/IV estimation.

(iv) Use `Table_3_4_WTP.xls` (or `Table_A9_A10_WTP.xls`) to calculate WTP using the IV coefficients from step (iii)

B - Elasticities and Policy simulations: use IV coefficient and change accordingly in the m-files to calculate elasticities and counterfactual results.

(v) Run `Elasticities_Simulation_girls.m` and `Elasticities_Simulation_boys.m` to calculate the elasticities and/or the policy counterfactuals results.

(vi) Import/copy from Matlab the elasticities (e.g. `elfee_mean_g`), compensating variation (e.g. `avgCV_nopr_g`), and probabilities (e.g. `Prob_nopr_g`) variables to Stata using `Data_elast_cv_g.do`

(vii) Run `Main_Tables_Figures.do` (or `Online-App_A_and_C.do`) to obtain the final results according to the outcome you are interested in.

Note: Each additional alternative analysis (different percentiles or robustness) requires to execute all previous steps according to the specification you are interested in. For some of the robustness analysis you may have to change the code accordingly to execute step (i).